# Inverse problems for non-linear partial differential equations

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Slides available at www.mv.helsinki.fi/home/lassas/

- ► An inverse problem for a linear wave equation
- Inverse problems for passive observations
- Inverse problems for non-linear wave equations
- Inverse problems for non-linear elliptic equations



#### Wave imaging and Riemannian geometry

Consider a body  $M \subset \mathbb{R}^3$  where the wave speed is varying. Travel time of waves between points determine a non-Euclidean metric

$$ds^2 = \sum_{j,k=1}^{n} g_{jk}(x) dx^j dx^k$$
, or with an isotropic wave speed,  $ds^2 = c(x)^{-2} dx^2$ 

The inverse problem for the linear wave equation is to determine the wave speed, or the metric  $(g_{jk}(x))_{j,k=1}^n$ , from boundary measurements.



Figures by C. Ammon (Proc. SPIE. 2015)

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## Why more mathematics is needed in imaging?

Traditional algorithms in medical imaging based on ray tracing cause artifacts. The ultrasound image taken during pregnancy (on left), has a mirror image artifact. This led to a wrong diagnosis of an extra-uterine pregnancy.



By using wave equation such ghost images do not appear.

Figure: Malhotra et al., West J Emerg Med. 2014

#### Geometric inverse problem for a linear wave equation

Let (M, g) be a Riemannian manifold with boundary, dim $(M) = n \ge 2$ . Let  $u(x, t) = u^{f}(x, t)$  solve the wave equation

$$(\partial_t^2 - \Delta_g)u(x, t) = 0 \quad \text{on } (x, t) \in M \times \mathbb{R}_+,$$
  
 $\partial_{\nu}u(x, t)|_{\partial M \times \mathbb{R}_+} = f(x, t),$   
 $u|_{t=0} = 0, \quad \partial_t u|_{t=0} = 0,$ 

where  $\nu$  is the unit normal of the boundary  $\partial M$  and

$$\Delta_g u = \sum_{j,k=1}^n |g(x)|^{-1/2} \frac{\partial}{\partial x^j} (|g(x)|^{1/2} g^{jk}(x) \frac{\partial}{\partial x^k} u(x)).$$

The measurements on the boundary are modelled by the Neumann-to-Dirichlet map

$$\Lambda f = u^f(x,t)\big|_{(x,t)\in\partial M\times\mathbb{R}_+}.$$

**Inverse problem:** Let (M,g) be a Riemannian manifold with boundary. Let the boundary  $\partial M$  and the map

$$\Lambda:\partial_
u u|_{\partial M imes \mathbb{R}_+} o u|_{\partial M imes \mathbb{R}_+}$$

be given. Can we construct a manifold (M', g') that is isometric to (M, g)?

**Example.** Let  $M = \mathbb{R}^2 \times \mathbb{R}_+$ . Can we construct the metric tensor g in local coordinate charts, or the wave speed function c(x), when the measurements are done on the boundary?



## Inverse problems for linear hyperbolic equations

- 1. Unique solvability of the inverse problem for  $(\partial_t^2 c(x)^2 \Delta)u = 0$  in  $\Omega \subset \mathbb{R}^n$  was proven by combining the boundary control method by Belishev 1987 and the unique continuation theorem by Tataru 1995.
- 2. Belishev-Kurylev 1992: Spectral problem for  $\Delta_g$  on a manifold.
- 3. Burago-Ivanov-L.-Lu 2020: Stability of the reconstruction of a Riemannian manifold from the boundary data.
- 4. Alexakis-Feizmohammadi-Oksanen 2022 (a recent breakthrough!): Determination of the lower order terms in wave equation when the metric depends on time and is close to the Euclidean metric.

All results 1-3 are based on Tataru's unique continuation theorem and require that the metric is time-independent.

Below, we will show how the non-linearity helps in solving inverse problems and consider a time-depending metric and the new stability results.

Outline:

- An inverse problem for a linear wave equation
- Inverse problems for passive observations
- Inverse problems for non-linear wave equations
- Inverse problems for non-linear elliptic equations



Figures: J. Cohn and HST/NASA/ESA





































## Inverse problem for point sources on a Riemannian manifold with boundary.

Assume that for all points x in M we know the boundary values of the wave produced by a point source that goes off at x at a known time. These data give us the boundary distance functions

 $r_x(z) = \operatorname{dist}_M(x, z), \ z \in \partial M \text{ for points } x \in M.$ 

Can we reconstruct (M, g) if we know  $\partial M$  and all boundary distance functions,  $\{r_x \in C(\partial M) : x \in M\}$ ?



When the times when the point sources goes off are unknown, a similar question for distance difference function is studied in L.-Saksala 2020 and Ivanov 2021.

## Reconstruction of the manifold from boundary distance functions

Assume that (M, g) is a compact Riemannian manifold with boundary. Recall that  $r_x(z) = \text{dist}_M(x, z), z \in \partial M$ .

#### Theorem (Kurylev 1997, Katcalov-Kurylev-L. 2001)

When  $\partial M$  and  $R(M) = \{r_x \in C(\partial M) : x \in M\}$  are given, we can uniquely determine the topological and differentiable structures of M and the metric g, up to an isometry.

A manifold M is called simple if it is diffeomorphic to a Euclidean ball, has no conjugate points, and the boundary is strictly convex.

For simple manifolds the map  $R: x \to r_x$  is an isometry,  $||r_x - r_y||_{\infty} = d_M(x, y)$ . Then, R(M) is a submanifold of  $C(\partial M)$  that is isometric to M.



Stability of the reconstruction is analyzed in [Fefferman-Ivanov-L.-Lu-Narayanan 2024].

## Inverse problems in space-time: Passive measurements



Can we determine the structure of the space-time when we see light coming from several point sources that vary in time?

## Determination of the metric of the space-time

There may exist several light rays between two points (i.e., there are conjugate points or caustics).

This causes difficulties in solving inverse problems in general space-times.



Figures: Einstein's ring by R. Gavazzi and T. Treu and a light source behind a wineglass by P. Doherty.

#### Inverse problem with passive observations

Passive imaging problem:

Assume that there are a large number of point sources in a subset U of a spacetime M. Light from these point sources are observed in a set V.

Do these observations determine the structure of the space-time in U?







# Definitions

Let (M, g) be a Lorentzian manifold, e.g.  $\mathbb{R}^4$ ,  $g = -dt^2 + dx^2$ .  $\gamma_{x,\xi}(s)$  is a geodesic with the initial point  $(x,\xi)$   $\xi \in T_x M$  is time-like if  $g(\xi,\xi) < 0$ ,  $\xi \in T_x M$  is light-like if  $g(\xi,\xi) = 0$ ,  $\xi \neq 0$ .

 $J^+(p) = \{x \in M | x \text{ is in causal future of } p\},\$  $J^-(p) = \{x \in M | x \text{ is in causal past of } p\}.$ 

#### (M,g) is globally hyperbolic if

there are no closed causal curves and the set  $J^+(p_1) \cap J^-(p_2)$  is compact for all  $p_1, p_2 \in M$ . Then M can be represented as  $M = \mathbb{R} \times N$ . We consider observations in an open set  $V \subset M$ . Assume that V is a union of time-like curves  $\mu_a : (-1, 1) \to M$ ,  $a \in A \subset \mathbb{R}^k$ . Let  $p_1, p_2 \in \mu_{a_0}$ .

Let  $U \subset J^-(p_2) \setminus J^-(p_1)$  be an open, relatively compact set.

The observation time function  $F_q: A \to \mathbb{R}$  for a point  $q \in U$  is

 $F_q(a) = \min\{s \in \mathbb{R} : \text{ there is a future-directed light-like} geodesic from q to <math>\mu_a(s)\}.$ 





#### Theorem (Kurylev-L.-Uhlmann 2018)

Let (M, g) be a globally hyperbolic Lorentzian manifold of dimension  $n \ge 3$ . Assume that  $\mu_a(-1, 1) \subset M$ ,  $a \in A \subset \mathbb{R}^m$  are time-like paths,  $V = \bigcup_{a \in A} \mu_a$  is open, and  $p_1, p_2 \in \mu_{a_0}$ . Let  $U \subset J^-(p_2) \setminus J^-(p_1)$  be a relatively compact open set and  $U' \subset U$  be dense. Then  $(V, g|_V)$  and the collection of the observation time functions,

$$\{ F_q : A \to \mathbb{R} \mid q \in U' \} \subset C(A),$$

determine the set U, up to a change of coordinates, and the conformal class of the metric g in U.



The imaging of the space-time is similar to triangulation used in map making.

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#### Non-linear wave equation in space-time

Let  $M = \mathbb{R} \times N$  be a Lorentzian manifold with the metric g, dim(M) = 1 + n,  $n \ge 2$ . Let  $m \ge 2$  and

$$\Box_g u(x) + u(x)^m = f(x), \quad (x^0, x^1, \dots, x^n) \in (-\infty, T] \times N,$$
  
$$u(x) = 0 \quad \text{for } t = x^0 < 0,$$

where

$$\Box_g u = \sum_{p,q=0}^n |\det(g(x))|^{-\frac{1}{2}} \frac{\partial}{\partial x^p} \left( |\det(g(x))|^{\frac{1}{2}} g^{pq}(x) \frac{\partial}{\partial x^q} u(x) \right).$$

where  $g = (g_{jk}(x))_{j,k=0}^n$  and  $(g^{jk}) = (g_{jk})^{-1}$ . An alternative model is

$$rac{\partial^2}{\partial t^2}u(t,y)-c(t,y)^2\Delta u(t,y)+a(t,y)u(t,y)^m=f(t,y),\quad x=(t,y)\in\mathbb{R}^{1+n}.$$

This corresponds to the Lorentzian metric  $g = -dt^2 + \sum_{j=1}^n c(t,y)^{-2} (dy^j)^2$ 

Theorem (Kurylev-L.-Uhlmann 2018 and L.-Uhlmann-Wang 2017) Let (M, g) be a globally hyperbolic Lorentzian manifold, dim(M) = 4,  $\mu \subset M$  be a time-like curve,  $p_1, p_2 \in \mu$  and V be a neighbourhood of  $\mu$ . Let  $L_V : f \mapsto u|_V$  be the source-to-solution map for

$$\Box_g u + u^2 = f \quad in (-\infty, T) \times N \subset M,$$
$$u = 0 \quad in \ t = x^0 < 0.$$

 $L_V: f \to u|_V$  is defined for small sources f,  $supp(f) \subset V$ . Then V and  $L_V$  determine  $W = J^+(p_1) \cap J^-(p_2)$  and the metric  $g|_W$  on it (up to change of coordinates).



Using non-linear interaction of waves we can solve inverse problems for non-linear equations that are unsolved for linear equations.

-The non-linear interaction of distorted plane waves creates artificial microlocal point sources.

-Observations for the point sources determine the conformal class of the metric g in the space-time  $J^+(p_1) \cap J^-(p_2)$ .

Movie



-The non-linear interaction

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#### Idea of the proof with a 4th order non-linear term

Consider in the Minkowski space  $\mathbb{R}^4$  the wave equation

$$\Box_g u_{\vec{\varepsilon}}(x) + a(x) (u_{\vec{\varepsilon}}(x))^4 = 0$$

where  $\vec{\varepsilon} = (\varepsilon_1, \varepsilon_2, \varepsilon_3, \varepsilon_4)$ . Assume  $u_{\vec{\varepsilon}}|_{\vec{\varepsilon}=0} = 0$ . Then, the linearized waves

$$u_j(x) = \partial_{\varepsilon_j} u_{\vec{\varepsilon}} |_{\vec{\varepsilon}=0}, \quad j=1,2,3,4$$

solve the linear wave equation  $\Box_g u_j = 0$  and

$$w = \partial_{\varepsilon_1} \partial_{\varepsilon_2} \partial_{\varepsilon_3} \partial_{\varepsilon_4} u_{\vec{\varepsilon}}(x) \big|_{\vec{\varepsilon}=0}$$

satisfies

$$\Box_g w = -24au_1u_2u_3u_4.$$

Assume  $u_j$  that depend on a parameter s > 0 and  $u_j^{(s)}(x) \to \delta(x \cdot \eta_j)$  as  $s \to 0$ . That is,  $u_j$  are close to plane waves supported on hyperplanes  $K_j = \{x \in \mathbb{R}^4 : x \cdot \eta_j = 0\}$ . Then, we can consider  $au_1u_2u_3u_4$  as a source that is supported on

$$K_1 \cap K_2 \cap K_3 \cap K_4 = \{q\} =$$
one point.



A similar result are valid for separated sources and observations: Assume that sources are supported in  $\Omega_{in}$  and the waves are observed in  $\Omega_{out}$ . The metric is determined in the set K enclosed by the black rectangle.

#### Theorem (Feizmohammadi-L.-Oksanen 2021)

Let G(x, s) be a Lorentzian metric tensor depending on s,  $\partial_s G(x, s)|_{s=0} = 0$  and  $\partial_s^2 G(x, s)|_{s=0} > 0$ . In the above geometric setting, the source-to-solution map  $L_G : C_0^{\infty}(\Omega_{in}) \to C^{\infty}(\Omega_{out})$  for

$$\sum_{p,q=0}^{n} G^{pq}(x,u(x)) \frac{\partial^{2} u}{\partial x^{p} \partial x^{q}}(x) = f, \quad supp \ (u) \subset J^{+}(supp \ (f))$$

determines the conformal class of g = G(x, 0) in K.



Figure shows the 3-interaction produced by three plane waves that travel closely to each other.



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Inverse problem in Minkowski space with a 1-dimensional measurement

Theorem (L., Liimatainen, Potenciano-Machado, Tyni 2024)

Let  $\Omega \subset \mathbb{R}^n$ , diam  $(\Omega) < D$ , and  $m \ge 2$ .

There is a measurement function  $\psi \in L^2(\partial \Omega \times [0, T])$  such that the following is true: Let supp  $(q) \subset \Omega \times [T - D, D]$ . For f small enough, let  $u = u^f$  satisfy

$$(\partial_t^2 - \Delta) u(x, t) + q(x, t) u(x, t)^m = 0$$
 in  $\Omega \times [0, T],$   
 $u|_{\partial\Omega \times [0, T]} = f, \quad u|_{t=0} = 0, \quad \partial_t u|_{t=0} = 0.$ 

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Then the real-valued non-linear map

$$\lambda_{q,\psi}: f \to \int_{\partial\Omega} \int_{[0,T]} \psi(x,t) \,\partial_{\nu} u^{f}(x,t) \, dS(x) dt$$

determines q(x, t) uniquely. Moreover, when  $\|q\|_{C^{n+1}} < C_0$ , the reconstruction is Hölder stable, that is,  $\|q_1 - q_2\|_{L^{\infty}} \le C \|\lambda_{q_1,\psi} - \lambda_{q_2,\psi}\|^{\alpha}_{C(B_{H^2}(0,\rho))}$ .

Thus q can be stably reconstructed from low resolution observations by varying f.

## Numerical results



Left: q(x, t). Center: Numerical reconstruction. Right: Error in reconstruction. Reconstruction of the coefficient q(x, t) in equation

$$\partial_t^2 u(x,t) - \partial_x^2 u(x,t) - q(x,t)u(x,t)^2 = 0, \quad x \in [0,1], \ t \in [0,T],$$

from measurement operator  $\lambda_{\psi}$ . Above, data has additive Gaussian noise and the signal-to-noise ratio is 12 dB.

#### The Einstein-scalar field equations

Similar techniques can be used for the inverse problem for the Einstein-scalar field equations for the metric g and the scalar fields  $\phi = (\phi_I)_{I=1}^L$ ,

$$\mathsf{Ein}(g) = \mathbb{T}(g, \phi) + \mathcal{F}^1, \tag{1}$$

$$\mathbb{T}_{jk}(g,\phi) = \sum_{l=1}^{L} \left( \partial_{j}\phi_{l}\partial_{k}\phi_{l} - \frac{1}{2}g_{jk}g^{pq}\partial_{p}\phi_{l}\partial_{q}\phi_{l} \right) - \mathcal{V}(\phi)g_{jk},$$
(2)  
$$\Box_{g}\phi_{l} - \mathcal{V}_{l}'(\phi) = \mathcal{F}_{l}^{2}, \quad l = 1, 2, ..., L.$$
(3)

Then the source-to-solution map  $\mathcal{F} \mapsto (g|_V, \phi|_V)$ , defined for sources that are supported in a neighborhood V of a time-like path from  $p_1$  to  $p_2$  and satisfy the physical conservation law, determines the conformal type of the space time  $J^+(p_1) \cap J^-(p_2)$ . [Kurylev-L.-Oksanen-Uhlmann 2022, Uhlmann-Wang 2020].

## Can we use methods of General Relativity in medical imaging?



Figures on Elastography:

M. Doyley, Phys. Med. Biol. 2012 , H. Tzschätzsch, Phys. Med. Biol. 2014.

Non-linearity can be used as a beneficial effect in medical imaging. For this, mathematics of general relativity is essential, see [de Hoop-Uhlmann-Wang 2020].

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Simultaneous recovery in 2D: metric and potential.

Theorem (L.,Liimatainen,Yi-Hsuan Lin, Salo 2019)

Let (M, g) be a compact connected manifold with boundary, dim(M) = 2 and  $m \ge 2$ . Let q(x) > 0 be a smooth function on M. For the equation

$$\Delta_g u(x) + q(x)u(x)^m = 0 \text{ in } M$$
$$u|_{\partial M} = f,$$

we define the Dirichlet-to-Neumann map

$$\Lambda_{M,g,q}: f \to \partial_{\nu} u|_{\partial M},$$

for small  $f \in C^3(\partial M)$ . Then  $\partial M$  and  $\Lambda_{M,g,q}$  determine the conformal type of (M,g) and the potential q and g up to a gauge transformation. The linear problem with m = 1 is solved in Carstea-Liimatainen-Tzou, Arxiv 2024. Similar results are obtained for the minimal surface equation and for parabolic equations.

# The idea of the proof

The Frechet derivative  $(D\Lambda_{M,g,q})_0$  determines the Dirichlet-to-Neumann map for the linear equation  $\Delta_g u = 0$ . By L.-Uhlmann 2001, this determines the conformal class of the two-dimensional manifold (M,g).

Let us choose a metric  $\hat{g} = hg$ ,  $h : M \to \mathbb{R}_+$ , that is conformal to g. The higher order derivatives of  $\Lambda_{M,\hat{g},q}$  satisfy

$$\int_{\partial M} (D^m \Lambda_{M,\hat{g},q})|_0[f_1, f_2, f_3, \dots, f_m] \cdot f_{m+1} \, dS = -(m!) \int_M q v_1 v_2 v_3 \cdots v_{m+1} \, dV$$

where  $v_k$ , k = 1, ..., m + 1, satisfy  $\Delta_{\hat{g}} v_k = 0$  with the boundary value  $f_k$ . Let  $v_3 = v_4 = \cdots = v_{m+1} = 1$ . By Guillarmou-Tzou 2011, the inner products  $\langle q, v_1 v_2 \rangle_{L^2(M)}$  determine q. Note that it is enough to study only the solutions satisfying  $\Delta_{\hat{g}} v = 0$ . Roughly speaking, we need to analyze only the linearized inverse problem and do not require analysis of the non-linear problem.

#### Thank you for your attention

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